N-VIEW SYNTHESIS FROM MONOCULAR VIDEO OF CERTAIN BROADCAST AND

5　STORED MASS MEDIA CONTENT

A PATENT APPLICATION BY

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I. BACKGROUND OF THE INVENTION

A. Field of the Invention

The invention relates to the field of synthesizing video material, particularly with a view to enhancing a three dimensional appearance of that material.

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B. Related Art

Synthesizing the image of a 3-D scene, as it would be captured by a camera from an arbitrary viewpoint, is a well-known research problem and several different approaches have been proposed. Given a complete 3-D model, it is possible to render the scene from any viewpoint.

10   Rendering techniques are well known in the field of Computer Graphics (as described, for example, in J.D. Foley, A. van Damm, S.K. Feiner, and J.F. Hughes, "Computer Graphics - Principles and Practice", Addison Wesley, Second Edition, 1992, Chapter 14). However, generation of the model is a tedious, error-prone and labor intensive task.

On the other hand, some researchers have tried to infer 3-D information directly from

15   images. Various methods have been developed for recovering both the shapes of the objects and the camera motion from a sequence of images (for example, O. Faugeras, "Three-Dimensional Computer Vision: a Geometric Viewpoint", MIT press, 1993). These methods are typically computationally intensive. Furthermore, in many cases the input sequence had been captured by a pan-tilt-zoom camera, preventing recovery of the 3D model of the scene.

20   Another approach is to perform image based rendering (as in L. MacMillan: "An Image

Based Approach to Three-Dimensional Computer Graphics", Ph.D. dissertation, University of

North Carolina, 1997), in which case no explicit 3-D model of the object and the environment is

required. These methods avoid reasoning in 3-D by using projective constraints and invariants.

5   II. SUMMARY OF THE INVENTION

It is an object of the invention to synthesize multiple views of a scene starting from a

monocular video sequence.

This is achieved in that for each input image, two or more new views of the scene are

generated. Such views are suitable for display on a 3D-TV device or any other suitable viewing

10   apparatus. The input images are segmented into moving objects and a stationary background. The

background may be further segmented into multiple regions. Applying appropriate

transformations to each region generates new views. Advantageously, simple domain knowledge

is used to create good approximations for the views, even when the necessary information is not

available from the image sequence.

15   Further objects and advantages will be apparent in the following.

III. BRIEF DESCRIPTION OF THE DRAWING

The invention will now be described by way of non-limiting example with reference to

the following drawings.

20   Fig. 1 shows a system in which the invention can be used.

Fig. 2 shows a flowchart of the invention.

Fig. 3 shows a schematic of an image to be processed in accordance with the invention.

Fig. 4 shows segmentation of moving obj2ects.

Fig. 5 shows a flowchart relating to use of domain knowledge and further segmentation of

5   the stationary background into multiple regions.

Fig. 6 illustrates aspects of how the new camera positions are derived.

Fig. 7 illustrates how transformations of the segmented objects are computed

Fig. 8 shows how the new views are created.

Figs. 9-13 show some formulae that will be used in the description of the preferred

10   embodiments.

IV. DETAILED DESCRIPTION OF THE PREFERRED EMBODIMENTS

Fig. 1 shows a typical 3-D image viewing apparatus, sometimes also referred to as a

15   virtual reality device. The device includes a processor 101, a memory 103, and, optionally

various peripherals, such as a display 102, a network connection 104, or other types of

peripherals not shown, such as a printer, keyboard, mouse, microphone, loudspeakers, camera,

and/or remote control device. The connections may be wired or wireless. The processor may be

of any type including embedded in a PC, television, or set top box. The device may access

20   additional processing or memory power via the network connection 104, which may be any

suitable network connection such as to the Internet, cable television, and/or a local area network

(LAN). Commonly the 3-D effect is achieved using a viewing device 105 that creates a stereo

image, with the difference between the images shown to each of the two eyes of the viewer

giving the illusion of three dimensions.

5   Fig. 2 shows a flowchart of the method according to the invention. The method may be

executed by the processor 101 or at a remote processor accessed via network connection 104.

Though the preferred embodiment is illustrated as software, it can equally well be implemented

in hardware by the skilled artisan.

The invention will also be described with respect to the schematic image of Fig. 3. Fig. 3

10   shows a tennis game. Two players, 303 and 302, play on a court 304, in front of the stands 301

where the audience sits. The court 304 and stands 301 are known types of objects within a

knowledge domain corresponding to tennis games.

The input is a sequence of images I_1, I_2, I_3, ..., for instance, taken during a tennis match.

Fig. 2 shows the steps that are applied to generate two stereoscopic views of the scene. The letter

15   "L" is used to refer to images and transformations relating to the left view of the stereoscopic

output, while the letter "R" is used to refer to images and transformations relating to the right

view.

At 201, moving objects are segmented from the stationary background. In this case,

players 302 and 303 will be segmented. The details of the segmentation method will be discussed

20   with respect to Fig. 4. Then at 202, domain knowledge is used to further segment the background

into individual regions. More about box 202 will be discussed with respect to Fig. 5.

At 203, the new views are chosen. Details will be explained with respect to Fig 6. The operations of boxes 202 and 203 may be performed in parallel.

At 204, for each region m, transformations TL_m and TR_m are computed. Fig. 7 illustrates

5   the method.

Then, at 205, the segmented regions are warped to create the left view, using transformations TL_m. The regions are also warped to create the right view, using transformations TR_m. Details are discussed with respect to Fig. 8.

10   Segmentation of moving objects

Fig. 4 is a flowchart showing the steps performed in box 201. In boxes 402, 405, and 409, the symbol "•" is used to indicate the application of a homography to an image.

15   4a. At 401, for each input image I_k, estimate the homography transformation H_k so that when H_k is applied to frame I_k, the image of the tennis court in the transformed frame is aligned with the image of the tennis court in the first frame I_1.

A homography is represented by a 3x3 matrix **H,** which maps a point (x, y) in the image to the point represented by formula (1) from Fig. 9, where the h_{ij} homography parameters are values

from the homography matrix H. This is well known in the art, for example in O. Faugeras,

Three-dimensional Computer Vision, referenced above.

5   The alignment of input images is done by computing spatio-temporal derivatives of the image

sequence, estimating normal flow, and linearly estimating the homography parameters. One

method for achieving this is found in R. Pless et al, "Detecting Independent Motion: The

Statistics of Temporal Continuity", Trans. IEEE PAMI, vol. 22, No. 8, Aug. 2000

Alternatively, feature points (such as corners) and/or lines could be located and matched

10   between the input images and the homography could be estimated from the matched features,

as shown in U.S. Pat. No. 5,629,988 issued to Burt et al.

At 402, J_k denotes the result of applying transformation H_k to the image I_k.

15   4b. From domain knowledge, it is known that in most tennis sequences the camera is allowed to

pan, tilt, and zoom, but otherwise is not moved around the court. For a pan-tilt-zoom camera

the transformation computed in box 401 aligns not only the tennis court, but also any other

stationary feature in the scene. Only the moving players are not aligned.

The transformed images J_k from step1 can be combined to create a mosaic of the scene at 403. For each pixel in the mosaic, there are one or more pixels from images J_k. In order to filter out moving objects (the players), a median filter is applied to the multiple values at each pixel and that median value is put into the mosaic M.

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The median value is computed as follows. Suppose there are values x_1, x_2,..., x_K for a certain pixel. The values are sorted and the sorted values are denoted y_1, y_2, ..., y_K, where $y_1 <= y_2 <= ... <= y_K$. The median value is then $y_{K/2}$.

10   An alternative way to create mosaics can be found in U.S. Pat. No. 5,629,988.

4c. When an inverse transformation (H_k^{-1}) is applied to mosaic M and the result is cropped appropriately, a background image B_k is obtained at 405. The background image is the same as the input image I_k, except that the moving objects are removed and replaced by pixels from

15   the background, which were visible in other views. .

4d. Then the input image I_k is compared with the corresponding background image B_k to create a mask image M_k at 406, whose pixel values are 1 when the difference between I_k and B_k is larger than a threshold and 0 otherwise. Then at 407 from image I_k those pixels are extracted

20   that are set to 1 in the mask image M_k and the remaining pixels are set to be black. The result

is an image F_k of moving objects.

Segmentation of stationary background

Fig. 5 shows an expansion of box 202. Domain identification can be obtained at 501 from electronic program guide data or by analyzing the closed captioning data in broadcast video. Even if no domain identification is available, it is possible to test whether the input video is from the correct domain by detecting the distinguishing features (box 502). If the expected features are detected, the method can proceed even without domain identification.

Domain knowledge may also be supplied, for example, through MPEG stream meta-data, which could be available in digital TV broadcasts. If only domain identification is to be transmitted, then domain knowledge will have to be stored in advance in memory 103.

In the example of Fig. 3, the domain knowledge would include the shape of the court 305, the fact that the center net 304 is vertical, and certain assumptions about the shape of the stands 301.

At box 502, distinguishing features of the domain are detected. In the case of the tennis match, a distinguishing feature would be the lines of the court 305. An additional feature would be the knowledge that the color of the tennis court is uniform. The features are detected as follows:

5a. Locate lines in the image. There are many known methods for detecting lines in images, for example.

5b. Locate large regions of uniform color and select only those lines found in step 5a that are

within such large regions.

5c. Match detected lines with line segments in the stored model. This is done by randomly

choosing two or more detected line segments and matching them with all segments in the

model. Each matching determines a transformation between the image and the model (this

transformation is a homography, because the court is planar).

5d. For each homography obtained in step 5c, apply the transformation to the input image and

find how many line segments in the transformed image match line segments in the model as

well as how well such segments are aligned.

5e. Steps 5c. and 5d. are repeated and a final transformation is chosen. Under the final

transformation, the most segments are matched and have the best alignment between the

transformed input and the model.

At 503, the background is further segmented into the tennis court and other regions. In the

case of the tennis match, these features might include the net, the umpire stand and the audience

stands 301. The regions are segmented based on domain knowledge. For example, the net is in a

known position with respect to the lines on the court. The umpire stand is known to be on the

court itself and its color is different from the color of the court, so it can be segmented based on

color. More about the type of segmentation necessary here can be found in Vishvjit S. Nalwa, *A*

Guided Tour of Computer Vision (Addison-Wesley, 1993) section 3.3, "Image Segmentation"

As a result of this step, one mask image is obtained per region (analogously to the mask image obtained in 406). For each region, those mask pixels that correspond to pixels in that region are set to 1 and the other pixels are set to 0.

5   ## Determine transformations of the tennis court

In Fig. 6, the transformations to be applied to the image of the tennis court are determined. By tennis court, only the ground is implied herein. The transformations for the other segmented background regions are determined in the next section: "Determine transformations of other regions" The transformations are homographies, since the court is planar. There are two

10   alternative ways of determining HL and HR.

6a.   If the matching between the model and the input image is available (601, from box 502), the intrinsic and extrinsic calibration parameters (with respect to the court) can be determined 602. There are known techniques for doing so, for example in Emanuele Trucco, Alessandro

15   Verri: "Introductory techniques for 3-D Computer Vision", Prentice Hall, 1998.

6b.   In a fully calibrated case, any new desired camera position can be chosen 603. For example, the new cameras can be placed closer to the court to enhance 3D perception. The homographies HL and HR can be determined in closed form from the old and the new camera parameters 604. How to do this is described in the Trucco & Verri book referenced above.

6c. If the system is not fully calibrated (calibration is not desired), heuristics 605 are used to

determine HL and HR. In this particular example, suppose the net and the far baseline are

approximately horizontal in the input image. For the bottom edge of the net, the Y-coordinate

will be denoted by y_1 and the width in the image by w_1. For the far baseline, the Y-coordinate

will be denoted by y_2 and the width by w_2.

Because the two line segments have the same length in the 3D world, the ratio of w_1/w_2 is the

same as the ratio of disparities for the two lines, in accordance with formula (13).

Similarly, the Y-coordinate of the bottom scan line will be denoted in the image by y_B. For

each viewing device, the disparities should be smaller than a certain maximum, denoted by

d_{MAX}. The maximum d_{MAX} might be, for example, 20 pixels.

Utilizing formula (4), the values for s_L, s_R, d_L and d_R may be derived. Of course, this is just

one of a possible set of solutions. At 606, by choosing $s_R = 0$ and $d_R = 0$, the right view can be

made identical to the input view. To obtain s_L and d_L, the two linear equations at (14) are

solved, one obtained from (13) and one from the maximum disparity constraint.

The values y_1, y_2, w_1, w_2 and y_B are measurements in the input image and d_{MAX} is a known

parameter of the viewing system, so s_L and d_L are the only unknowns in the equations above.

Consequently, the homographies of formulae (2) and (3) of Fig. 9 can be used 607.

These two homographies do not change the Y coordinate and thus create rectified stereo views, where corresponding features lie on the same scan lines in both images.

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The heuristic described above is only an example. If other known features on the court can be detected, analogous methods can be used to determine suitable homographies **HL** and **HR**.

Determine transformations of other regions

10   In addition to the tennis court, the scene contains moving objects (segmented in 407) and segmented parts of the background (from 503). With reference to Figure 7, it will now be explained how transformations TLm and TRm can be obtained for these regions. The procedure is explained for the segmented player regions, but the same (or quite similar) procedure can be applied to other regions.

15   If the new view is similar to the original view (which is usually the case), the player is approximated as being in a fronto-parallel plane. This is a valid approximation considering the distance between the player and the camera. The TLm transformation is determined with respect to a bounding rectangle 701 around the region containing the foreground object 303. The lower left corner is denoted as A, the lower right corner as B, and the mid-point between A and B as C.

The player 303 is assumed to be standing on the court and therefore the lower line of the

bounding rectangle 701 is assumed to lie on the ground. The tennis court is transformed by

homography HL. Specifically, homography HL transforms points A, B, C to points A', B', C',

respectively, in the new view.

5   TLm must be compatible with HL: Point C should be transformed to C' and the

horizontal distance between transformed points A, B should equal the horizontal distance

between points A', B'. Finally, the aspect ratio (width divided by height) of the bounding box

should remain constant. Consequently, formula (5) is derived.

Formulae (6), (7), (8), (9), (10), and (11) of Fig. 9 are variable definitions for formulae

10   (12) of Fig. 10.   In each of the formulae (6)-(11) x and y coordinates are defined for points in

Figure 7 and their transforms.

The transformation for the right view TRm, per formula (18) can be derived analogously,

The variables appearing in the formula for **TR** are defined in formula (19).   These in turn are

derived from the assumption that homography **HR** transforms points A, B, C, to points A'', B'',

15   C'', where these points are defined in formulae (15), (16) and (17) respectively.

The objects (for example the tennis players) appear to "stand out", because they are

transformed differently from the tennis court (the ground). The transformations of the tennis

court (the HL and HR homographies) are setup so that points higher in the image appear farther

from the viewer. On the other hand, all the points on the tennis player appear at approximately

20   the same distance from the viewer.

The transformations TLm and TRm differ from the transformations HL and HR that are applied to the ground portion of tennis court. Consequently, the tennis player appears to "stand out" from the background. More specifically, the HL and HR transformations are generally constructed so that points on the far side of the court have smaller disparities and thus appear farther from the viewer. This creates a correct, slanted appearance of the court. On the other hand, the TLm and TRm transformations make all the points of the tennis player appear at approximately the same distance.

The player's feet have approximately the same disparity as the nearby points of the court. Also, the disparity of the player's head will be approximately the same. However, points on the court that appear close to the player's head have smaller disparities and this makes the player "stand out" from the background. Other features, such as the umpire stand, are transformed analogously to the tennis players and thus also appear to "stand out" from the background.

Creating the new views

Finally, the new views are created as described in Figure 8. In previous steps, the input image was segmented into multiple regions and a transformation was computed for each region. In fig. 8 there are two paths. The left path corresponds to generation of the left view and the right path corresponds to generating the right view. The two paths are shown as being executed in parallel; however, they might equally well be executed sequentially.

At 801, the respective left view transformation TLm is applied to the image region, I_k, and

also to each mask, M_k, to yield transformed image region ILm and transformed mask MLm. **HL** is also applied to the background mosaic B_k, created in box 405. For the ground portion of tennis court, the transformation TLm is the homography HL

At 802, the transformed regions are combined to create the new left view. Whenever a pixel in the transformed mask MLm is 1, the corresponding pixel in ILm is copied to the output image.

At 803, conflicts resulting from overlapping objects are resolved.

If for some a, b, the objects overlap, i.e., ML_a(pixel)=1 and ML_b(pixel)=1, then L_k(pixel) should be set to the pixel IL(pixel) from the closest object, with object ordering defined below.

Object ordering:

For each object, the bottom edge should be taken to yield its position on the reference plane. Closer objects then have the bottom edge lower in the input image. The reference plane (the tennis court) is ordered as the most distant objects.

Also at 804, optionally, holes may be filled, where holes are pixels that are not covered by the segmented objects. If the black pixels are on the boundary, they should be left untouched, because they most likely correspond to locations never seen in the scene. On the other hand, the appropriate values from the background mosaic can fill holes inside the image, if such values are available.

Boxes 801', 802', 803', and 804' are analogous to 801-804, respectively, with R, i.e. the

right view, replacing L, i.e. the left view.

The example of Figures 4—8 is worked out in terms of a device that uses stereo images

to create a 3-D effect. However, the method is extendable to an implementation with an arbitrary

5   number of views. The computation of the right view, that is, computation of HR, TRm etc. was

completely independent of the computation of the left view (HL, TLm, etc.). Thus it is

straightforward to generate N different views of the scene by repeating the algorithm N times.

Typically, the N views would be generated according to the requirements of a particular display

device.

10 Alternate embodiment for transformation of background pixels

An alternate embodiment for dealing with background areas can be derived from use of a

second image of the same scene. In the following, it will be assumed that moving objects are

already segmented from the image. The operations below may be used to estimate the

appearance of stationary objects not on the reference plane (the tennis court), in accordance with

15 the following

1. First correspondences between pixels in the two images are established, manually, or

    automatically, *see* "Chapter 6 Stereo Vision", Three Dimensional Computer Vision, Olivier

    Faugeras, MIT Press, 1993.

2. The first images are registered up to an affine transform:

20   a. two corresponding pairs of parallel lines on a plane are identified in accordance with

formulae (20) and (21). The copairs of lines are denoted by PL1=[L11,L12] and

PL2=[L21, L22], where L11, L12, L21, L22, are lines defined by endpoints L_{ij} = [(sx_{ij},

sy_{ij}), (ex_{ij}, ey_{ij})].

5   b. The vanishing point (in homogeneous coordinates) for each pair of parallel lines is

computed in accordance with formulae (20) and (21), where the notation of the cross

product of a and b is shown in formula (22).

c. The transform H_a that moves vp_1=[x_1 y_1 w_1] and vp_2=[x_2 y_2 w_2] to infinity is computed in

10   accordance with formula (23).

d. Apply H_a to the whole image, i.e., pixel according to formula (24) is moved according to

formula (25).

15   3. Find 4 or more points on a plane in the first image and their corresponding points in the

second image. In accordance with formula (26) the transform H_b is computed. This transform

moves these points in second image q_1 q_2 q_3 q_4, ... to align with those in the first image (after

applying H_a), p_1', p_2', p_3', p_4', ...:

20   Thereafter, H_b is applied to the whole image, i.e., the pixel in accordance with formula (2) is

moved to the pixel in accordance with formula (28).

4. Using 2 pairs of corresponding points p_a' and p_b' in the first image, and q_a' and q_b' in the second image, the epipoles between the transformed input images and the output image are computed. If e12 denotes the epipole between the input images, e12' denotes the epipole between the transformed first image and the output image, e22' denotes the epipole between the transformed second image and the output image, then -- in homogeneous coordinates -- formulae (29) and (30) are obtained., which corresponds to formula (31) in real coordinates: where w is a ratio.

5. For each corresponding points p_i in the transformed first image and q_i in the transformed second image, the location r_i ' is computed in homogenous coordinates in accordance with formula (32) for the point in the new view.

6. All points r_i ', are moved to the point r_i in accordance with formula (33), where e_{12}' = [ex_{12}' ey_{12}'], and d is a constant.

Thus, when two images are used, there is effectively a separate transformation for each pixel of the stationary background, while in the first described embodiment, the background is covered by one or more transformations, each of which relates to a number of pixels.

The disparity in the registered images depends only on the translation between the centers of the two cameras. In generating the new view, one can change the disparity to agree with the translation with respect to the location of the center of the new camera. Such a transformation is described in: M. Irani, P. Anandan, D. Weinshall, "From Reference Frames to Reference Planes: A New Framework for 3D Scene Analysis". Proceedings: Fifth European Conference on Computer Vision, Freiburg, June 1998.

From reading the present disclosure, other modifications will be apparent to persons skilled in the art. Such modifications may involve other features that are already known in the design, manufacture and use of virtual reality type systems and which may be used instead of or in addition to features already described herein. Although claims have been formulated in this application to particular combinations of features, it should be understood that the scope of the disclosure of the present application also includes any novel feature or novel combination of features disclosed herein either explicitly or implicitly or any generalization thereof, whether or not it mitigates any or all of the same technical problems as does the present invention. The applicants hereby give notice that new claims may be formulated to such features during the prosecution of the present application or any further application derived therefrom. In particular, although claims are formulated herein for a method, Applicant reserves the right to add apparatus and software claims in the future.

The word "comprising", "comprise", or "comprises" as used herein should not be viewed as excluding additional elements. The singular article "a" or "an" as used herein should not be

viewed as excluding a plurality of elements.